

University of Stuttgart
Institute for Theoretical Chemistry



Use of automated
term-generation and
general tensor contractions in
electronic structure theory

ESNT-Workshop
“Automated tools for many-body theory”

June 6, 2023

Andreas Köhn

Motivation

Main target: Electronic Schrödinger equation for many-electron systems (molecules)

$$(\hat{T}_e + \hat{V}_{ne} + \hat{V}_{ee})|\Psi_e\rangle = |\Psi_e\rangle E_e$$

Main formalism: Second quantization

$$\hat{V}_{ee} = \frac{1}{4} \sum_{pqrs} g_{pqrs}^{qs} \hat{a}^p \hat{a}^r \hat{a}_s \hat{a}_q$$

Main ansatz for wavefunctions: $e^{\hat{T}} |\Psi_{\text{ref}}\rangle$

Main issue: lengthy expressions

$$\begin{aligned} & \mathcal{L}_{\text{SP}} + V_a^a \bar{t}_a^a + \bar{B}_1^a \bar{t}_a^a - X_1^a F_j^a \bar{t}_a^a + B_1^a \bar{t}_a^a + F_j^a \Lambda_j^a \mathcal{R}_{ap}^{\text{ib}} \bar{t}_a^a - F_j^a \Lambda_j^a \mathcal{R}_{ap}^{\text{ib}} \bar{t}_b^a - \Lambda_j^a G_{ik}^a \mathcal{R}_{ap}^{\text{ib}} \bar{t}_b^a + \Lambda_j^a V_{ab}^a \bar{t}_b^a - \Lambda_j^a V_{ik}^a \bar{t}_b^a \\ & + \Lambda_j^b V_{ik}^b \bar{t}_b^a - \Lambda_j^a V_{ab}^a \bar{t}_b^a - G_{ik}^a \Lambda_j^b \mathcal{R}_{bp}^{\text{ic}} \bar{t}_c^a + G_{ik}^a \Lambda_j^a \mathcal{R}_{bp}^{\text{ic}} \bar{t}_c^a - G_{ij}^a \Lambda_k^b \mathcal{R}_{bp}^{\text{ic}} \bar{t}_c^a + \Lambda_{ij}^a C_{ab}^c \bar{t}_c^a + \Lambda_{ik}^a C_{ab}^c \bar{t}_c^a \\ & - \Lambda_{ij}^a G_{ka}^b \mathcal{R}_{bp}^{\text{ic}} \bar{t}_c^a + \Lambda_{ij}^a V_{ab}^c \bar{t}_c^a - F_j^a \Lambda_{ik}^b \mathcal{R}_{ap}^{\text{ic}} \bar{t}_c^a - \Lambda_{ij}^a G_{kl}^b \Lambda_k^c \mathcal{R}_{bp}^{\text{ic}} \bar{t}_c^a + \Lambda_{ik}^a V_{ja}^b \bar{t}_c^a \\ & + \Lambda_{kl}^a G_{ia}^b \Lambda_b^c \mathcal{R}_{cp}^{\text{id}} \bar{t}_d^a - \Lambda_{ij}^a G_{kb}^c \Lambda_c^d \mathcal{R}_{ap}^{\text{id}} \bar{t}_d^a + \Lambda_{jk}^a G_{ic}^b \Lambda_c^d \mathcal{R}_{bp}^{\text{id}} \bar{t}_d^a + \Lambda_{ik}^a V_{jl}^b \bar{t}_c^a - \Lambda_{ik}^a V_{jl}^b \bar{t}_c^a + \Lambda_{kl}^a V_{ij}^b \bar{t}_c^a \\ & - G_{kl}^a \Lambda_{ij}^b \Lambda_{ab}^c \mathcal{R}_{cp}^{\text{id}} \bar{t}_d^a + G_{il}^a \Lambda_{jk}^b \Lambda_{ab}^c \mathcal{R}_{cp}^{\text{id}} \bar{t}_d^a - G_{ik}^a \Lambda_{jl}^b \Lambda_{ab}^c \mathcal{R}_{cp}^{\text{id}} \bar{t}_d^a - G_{ij}^a \Lambda_{kl}^b \Lambda_{ac}^c \mathcal{R}_{bp}^{\text{id}} \bar{t}_d^a + \frac{1}{2} \Lambda_{il}^a V_{jk}^b \bar{t}_c^a \\ & - G_{ji}^a \Lambda_{ik}^b \Lambda_{ab}^c \mathcal{R}_{ap}^{\text{id}} \bar{t}_d^a - G_{ij}^a \Lambda_{kl}^b \Lambda_{ab}^c \mathcal{R}_{cp}^{\text{id}} \bar{t}_d^a - G_{ik}^a \Lambda_{jl}^b \Lambda_{ab}^c \mathcal{R}_{bp}^{\text{id}} \bar{t}_d^a + \bar{\Lambda}_1^a [V]_a^a + \bar{\Lambda}_1^a \bar{B}_a^a - \bar{\Lambda}_1^a F_j^a \bar{t}_a^a + \bar{\Lambda}_1^a \\ & + \bar{\Lambda}_1^b F_j^a \bar{t}_a^a + \bar{\Lambda}_1^a X_{ja}^b F_j^a \bar{t}_b^a - \bar{\Lambda}_1^a F_j^a X_{ab}^b - \bar{\Lambda}_1^a B_a^a + \bar{\Lambda}_1^a B_a^b \bar{t}_b^a - \bar{\Lambda}_1^a B_a^b \bar{t}_b^a - \bar{\Lambda}_1^a [R]_{ia}^a G_{jp}^b \bar{t}_b^a + \bar{\Lambda}_1^a [V]_a^a \\ & + \bar{\Lambda}_1^b [C]_{ic}^a \bar{t}_a^a + \bar{\Lambda}_1^b [R]_{ic}^a G_{jp}^b \bar{t}_b^a - \bar{\Lambda}_1^b [R]_{ic}^a G_{jp}^b \bar{t}_b^a + \bar{\Lambda}_1^b [V]_{ic}^a \bar{t}_a^a - \bar{\Lambda}_1^b [R]_{ic}^a G_{jp}^b \bar{t}_b^a + \bar{\Lambda}_1^b [R]_{ic}^a G_{jp}^b \bar{t}_b^a \\ & + \bar{\Lambda}_1^b [V]_{ib}^a \bar{t}_a^a + \bar{\Lambda}_1^b [R]_{ic}^a G_{jp}^b \bar{t}_b^a - \bar{\Lambda}_1^b [R]_{ic}^a G_{jp}^b \bar{t}_b^a + \bar{\Lambda}_1^b [R]_{ic}^a G_{jp}^b \bar{t}_b^a + \bar{\Lambda}_1^b [R]_{ic}^a G_{jp}^b \bar{t}_b^a \end{aligned}$$



Generalized Contraction Code (GeCCo)

First git log message: Thu Mar 15 12:40:33 2007 +0100

Designed based on ideas gathered from Jeppe Olsen's LUCIA code

Public version at github.com/ak-ustutt/GeCCo-public

Disclaimer: Pure development code with (unfortunately) bad documentation and a lot of hot-fixes 🥲

Mainly stand-alone code, integrals from Dalton, Molpro (and everything that provides a FCIDUMP file)

Originally intended for: General-order CC (with selection)

But then used for: Explicitly-correlated CC

And more lately: Multireference CC



Text art by Mathias Pabst

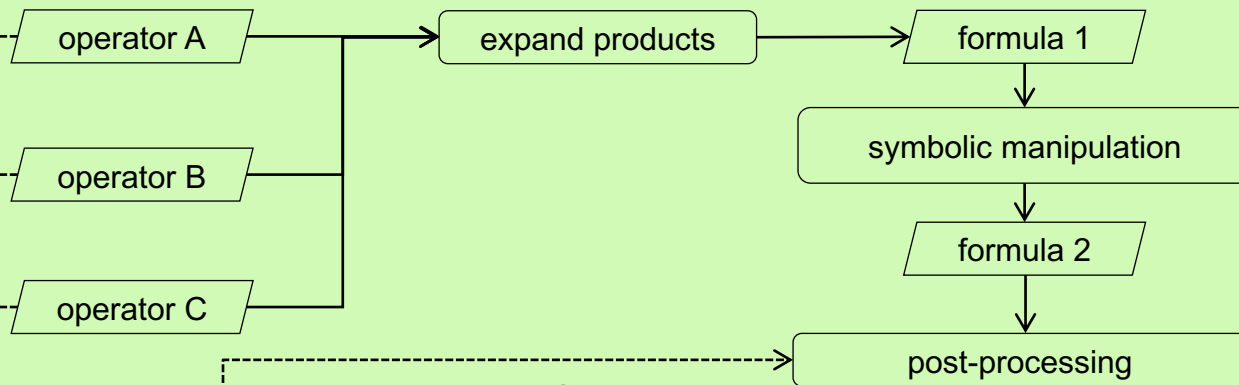
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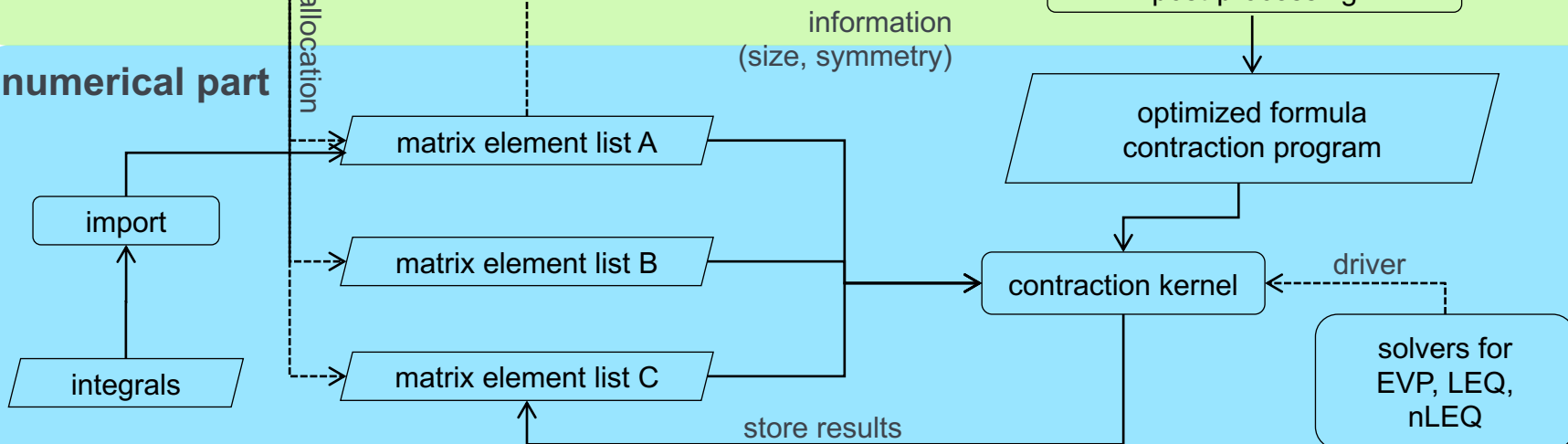


Organization of GeCCo – basic idea

symbolic algebra



numerical part



Generating equations: Basic objects

Representation of operators:

$$\hat{T}_2 = \sum_{i,u,a>b} t_{ab}^{iu} \{\hat{a}^a \hat{a}^b \hat{a}_u \hat{a}_i\}$$

name: T2

H P V H P V

occupation: (0, 2, 0; 1, 0, 1) or "PP;HV"

creations annihilations

\hat{H} :

$$E_i = \langle 0 | \hat{H} | 0 \rangle$$

$$\sum_{i,j} f_i^j \{\hat{a}^i \hat{a}_j\}$$

name: H

occupation: (0, 0, 0; 0, 0, 0) or ";"

occupation: (1, 0, 0; 1, 0, 0) or "H;H"

...

$$\sum_{i>j,u,a} g_{ij}^{au} \{\hat{a}^i \hat{a}^j \hat{a}_u \hat{a}_a\}$$

occupation: (2, 0, 0; 0, 1, 1) or "HH;PV"

...

"blocks"

particle
(P)



a, b, \dots

u, v, \dots

i, j, \dots



Generating equations: Basic objects

Representation of multiconfigurational state:

$$|\Psi_0\rangle = \sum_{tuvw} C_{tuvw}^{(0)} \{\hat{a}^t \hat{a}^u \hat{a}^v \hat{a}^w\} |0\rangle \quad \text{name: } c_0$$

occupation: (0 , 0 , 4 ; 0 , 0 , 0) or "VVVV;"

$$\langle \Psi_0 | = \sum_{tuvw} \langle 0 | \{\hat{a}_w \hat{a}_b \hat{a}_u \hat{a}_t\} C_{tuvw}^{(0)}$$

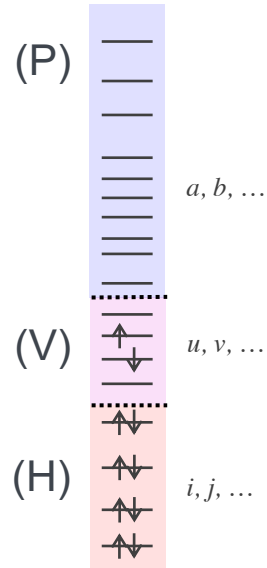
address as: c_0^+

occupation (transposed):
(0 , 0 , 0 ; 0 , 0 , 4) or ";VVVV"

Representation of density matrices:

$$\begin{aligned} \gamma_{t'u'v'}^{tuv} &= \langle \Psi_0 | \{\hat{a}^t \hat{a}^u \hat{a}^v \hat{a}_{v'} \hat{a}_{u'} \hat{a}_{t'}\} | \Psi_0 \rangle \\ &= -\langle \Psi_0 | \{\hat{a}_{v'} \hat{a}_{u'} \hat{a}_{t'} \hat{a}^t \hat{a}^u \hat{a}^v\} | \Psi_0 \rangle \quad \text{occupation:} \\ &\quad (0 , 0 , 0 ; 0 , 0 , 3 | 0 , 0 , 3 ; 0 , 0 , 0) \\ &\quad \text{or ";VVV | VVV;" } \end{aligned}$$

"double-vertex repr." (see later)



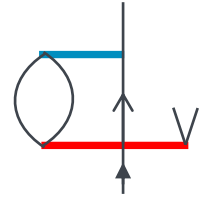
Generating equations: Operator products

Binary product:

$$\begin{aligned}
 & A_{ia}^{cd} \{ \hat{a}^i \hat{a}^a \hat{a}_d \hat{a}_c \} B_{efg}^{jkt} \{ \hat{a}^e \hat{a}^f \hat{a}^g \hat{a}_t \hat{a}_k \hat{a}_j \} \stackrel{\text{Wick}}{=} (C_0)^{jkcdt} \{ \hat{a}^i \hat{a}^a \hat{a}_d \hat{a}_c \hat{a}^e \hat{a}^f \hat{a}^g \hat{a}_t \hat{a}_k \hat{a}_j \} + \\
 & \quad (1,1,0;0,2,0) \quad (0,3,0;2,1,0) \quad (C_{1,1})^{jkcdt} \{ \hat{a}^i \hat{a}^a \hat{a}_d \hat{a}_c \hat{a}^e \hat{a}^f \hat{a}^g \hat{a}_t \hat{a}_k \hat{a}_j \} + \dots \\
 & \quad [A] \quad [B] \\
 & \quad (C_{3,1})^{jkt} \{ \hat{a}^i \hat{a}^a \hat{a}_d \hat{a}_c \hat{a}^e \hat{a}^f \hat{a}^g \hat{a}_t \hat{a}_k \hat{a}_j \} + \dots
 \end{aligned}$$

Contraction matrix

	represent as		
	A	B	C
A	(0,0,0;0,0,0)	(1,0,0;0,2,0)	(0,1,0;0,0,0)
B	(0,2,0;1,0,0)	(0,0,0;0,0,0)	(0,1,0;1,0,1)
			(0,2,0;1,0,1)



Unique rep. for all topologically equivalent contractions (diagrams) (related to adjacency matrix)

No sign determination at this point

Formalism:

$$[A] = [A]_c + [A]_0$$

$$[B]_c = [A^\dagger]_c$$

$$[B] = [B]_c + [B]_0$$

$$[C] = [A]_0 + [B]_0$$

inspiration: LUCIA (J. Olsen) and M. Kállay's publication on CC eq.s



Generating equations: Operator products

General product of n operators:

	A_1	A_2	...	A_n	R	R'
A_1	$[A_1]_1$	$[A_1]_2$...	$[A_1]_n$	$[A_1]_0$	$[A_1]_0'$
A_2	$[A_2]_1$	$[A_2]_2$...	$[A_2]_n$	$[A_2]_0$	$[A_2]_0'$
...
A_n	$[A_n]_1$	$[A_n]_2$...	$[A_n]_n$	$[A_n]_0$	$[A_n]_0'$

> 1 result vertex, if no reordering desired, e.g. for densities:

$$\gamma_{aj}^{ib} \leftarrow \sum_{ck} \lambda_{kj}^{cb} t_{ac}^{ik}$$



Recursive algorithm to determine all possibilities (for given result occupation)

Most frequent case: $(0, 0, 0; 0, 0, 0)$ (i.e. scalar result, “closed diagrams”)

Store result as sequence of contraction matrices (= “formula”)
(+ info on num. prefactor)



Generating equations: Symbolic manipulations

Typical strategy:

Define method via stationary energy functional

$$\mathcal{L} = \langle \Phi_0 | (1 + \hat{\Lambda}) e^{-\hat{T}} \hat{H} e^{\hat{T}} | \Phi_0 \rangle$$

Get working equations as formal derivatives

$$\frac{\partial}{\partial \lambda_\rho} \mathcal{L} = \langle \Phi_0 | \hat{\tau}_\rho^\dagger e^{-\hat{T}} \hat{H} e^{\hat{T}} | \Phi_0 \rangle$$

$$\frac{\partial}{\partial t_\rho} \mathcal{L} = \langle \Phi_0 | (1 + \hat{\Lambda}) [e^{-\hat{T}} \hat{H} e^{\hat{T}}, \hat{\tau}_\rho] | \Phi_0 \rangle$$

Example term:



	LAM	H	T	L
LAM	(0,0,0;0,0,0)	(0,0,0;0,1,0)	(1,0,0;0,0,0)	(0,0,0;0,0,0)
H	(0,1,0;0,0,0)	(0,0,0;0,0,0)	(1,0,0;0,2,0)	(0,0,0;0,0,0)
T	(0,0,0;1,0,0)	(0,2,0;1,0,0)	(0,0,0;0,0,0)	(0,0,0;0,0,0)

	H	T	OMG
H	(0,0,0;0,0,0)	(1,0,0;0,2,0)	(0,1,0;0,0,0)
T	(0,2,0;1,0,0)	(0,0,0;0,0,0)	(0,0,0;1,0,0)



	LAM	H	JT
LAM	(0,0,0;0,0,0)	(0,0,0;0,1,0)	(1,0,0;0,0,0)
H	(0,1,0;0,0,0)	(0,0,0;0,0,0)	(1,0,0;0,2,0)



Generating equations: Further manipulations

- Factor out $R = LH + LHT \xrightarrow{I = H + HT} R = LI$
- Expand $R = LI \xrightarrow{I = H + HT} R = LH + LHT$
- Transpose $HT + T^\dagger HT \longrightarrow T^\dagger H + T^\dagger HT$
- Sum up $HT + T^\dagger HT - T^\dagger H - T^\dagger HT \longrightarrow HT - T^\dagger H$



Generating equations: Input language

make inspired work-flow driver:

define targets, dependencies, rules (= command sequences)

V0: hard-coded

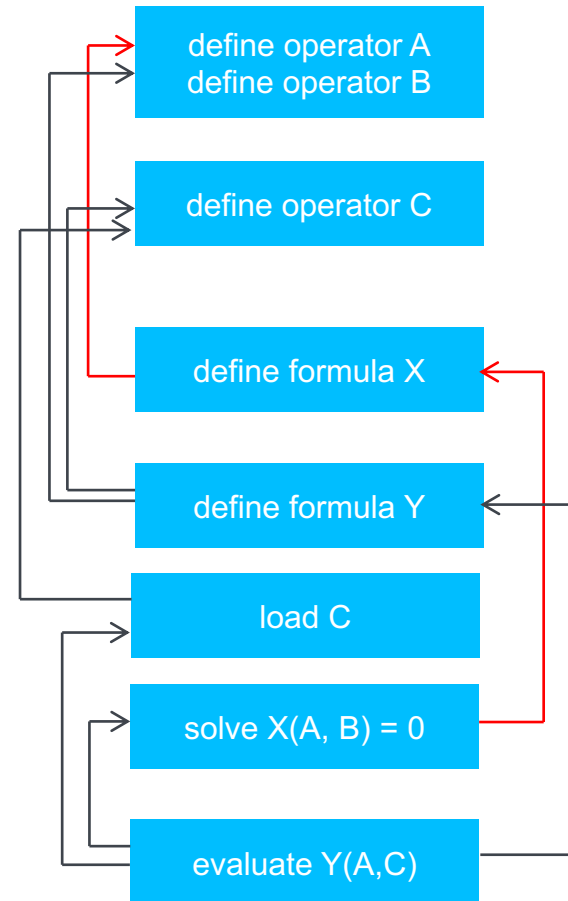
V1: simple self-written parser

V2: use Python as input parser (allow additional logic)

V2a: Python-based parsing of equation strings

Note: Python parsing only at initial input read-in

Conversion to input for Fortran, actual program is purely Fortran90 (and sometimes beyond)



Generating equations: Input language example

```
# Operators -----  
new_target('CCD_OPS')  
DEF_SCALAR({LABEL:'LCCD'})  
DEF_SCALAR({LABEL:'ECCD'})  
DEF_EXCITATION({LABEL:'T2',MIN_RANK:2,MAX_RANK:2})  
CLONE_OPERATOR({LABEL:'02',TEMPLATE:'T2'})  
CLONE_OPERATOR({LABEL:'L2',TEMPLATE:'T2',ADJOINT:True})
```

```
# CC Lagrangian -----  
new_target('CCD_LAG')  
depend('H')  
depend('CCD_OPS')  
form_l1 = stf.Formula("CCD_LAG:LCCD=<H+[H,T2]>")  
form_l1.append("<L2*(H+[H,T2]+0.5*[[H,T2],T2])>")  
form_l1.set_rule()  
PRINT_FORMULA({LABEL:'CCD_LAG',MODE:'SHORT'})
```

$$\hat{T}_2$$

$$\Omega_2 = \langle \Phi_0 | \hat{a}_{ab}^{ij} \bar{H} | \Phi_0 \rangle$$

$$\hat{\Lambda}_2$$

$$\begin{aligned} \mathcal{L} &= \langle \Phi_0 | (1 + \hat{\Lambda}_2) e^{\hat{T}_2} \hat{H} e^{\hat{T}_2} | \Phi_0 \rangle \\ &= \langle \Phi_0 | \hat{H} + [\hat{H}, \hat{T}_2] | \Phi_0 \rangle \\ &\quad + \langle \Phi_0 | \hat{\Lambda}_2 (\hat{H} + [\hat{H}, \hat{T}_2]) + \frac{1}{2} [[\hat{H}, \hat{T}_2], \hat{T}_2] | \Phi_0 \rangle \end{aligned}$$



Generating equations: Input

```
# Operators -----
new_target('CCD_OPS')
DEF_SCALAR({LABEL: 'LCCD'})
DEF_SCALAR({LABEL: 'ECCD'})
DEF_EXCITATION({LABEL: 'T2', MIN_RANK: 2, MAX_RANK: 2})
CLONE_OPERATOR({LABEL: 'O2', TEMPLATE: 'T2'})
CLONE_OPERATOR({LABEL: 'L2', TEMPLATE: 'T2', ADJOINT: 1})
```

1	LCCD(1)	<-	1.000000	H(1)
2	LCCD(1)	<-	1.000000	H(8) T2(1) [1,2,HH,PP]
3	LCCD(1)	<-	1.000000	L2(1) H(12) [1,2,HH,PP]
4	LCCD(1)	<-	1.000000	L2(1) H(2) T2(1) [1,2,H,] [1,3,H,PP] [2,3,H,]
5	LCCD(1)	<-	1.000000	L2(1) H(5) T2(1) [1,2,,P] [1,3,HH,P] [2,3,,P]
6	LCCD(1)	<-	1.000000	L2(1) H(6) T2(1) [1,2,HH,] [1,3,,PP] [2,3,HH,]
7	LCCD(1)	<-	1.000000	L2(1) H(10) T2(1) [1,2,H,P] [1,3,H,P] [2,3,H,P]
8	LCCD(1)	<-	1.000000	L2(1) H(14) T2(1) [1,2,,PP] [1,3,HH,] [2,3,,PP]
9	LCCD(1)	<-	1.000000	L2(1) H(8) T2(1) T2(1) [1,3,H,] [2,3,H,PP] [1,4,H,PP] [2,4,H,]
10	LCCD(1)	<-	1.000000	L2(1) H(8) T2(1) T2(1) [1,3,HH,] [2,3,,PP] [1,4,,PP] [2,4,HH,]
11	LCCD(1)	<-	1.000000	L2(1) H(8) T2(1) T2(1) [1,3,,P] [2,3,HH,P] [1,4,HH,P] [2,4,,P]
12	LCCD(1)	<-	0.500000	L2(1) H(8) T2(1) T2(1) [1,3,H,P] [2,3,H,P] [1,4,H,P] [2,4,H,P]

```
# CC Lagrangian -----
new_target('CCD_LAG')
depend('H')
depend('CCD_OPS')
form_l1 = stf.Formula("CCD_LAG:LCCD=<H+[H,T2]>")
form_l1.append("<L2*(H+[H,T2]+0.5*[[H,T2],T2])>")
form_l1.set_rule()
PRINT_FORMULA({LABEL: 'CCD_LAG', MODE: 'SHORT'})
```

$$\begin{aligned} \mathcal{L} &= \langle \Phi_0 | (1 + \hat{\Lambda}_2) e^{\hat{T}_2} \hat{H} e^{\hat{T}_2} | \Phi_0 \rangle \\ &= \langle \Phi_0 | \hat{H} + [\hat{H}, \hat{T}_2] | \Phi_0 \rangle \\ &\quad + \langle \Phi_0 | \hat{\Lambda}_2 (\hat{H} + [\hat{H}, \hat{T}_2]) + \frac{1}{2} [[\hat{H}, \hat{T}_2], \hat{T}_2] | \Phi_0 \rangle \end{aligned}$$

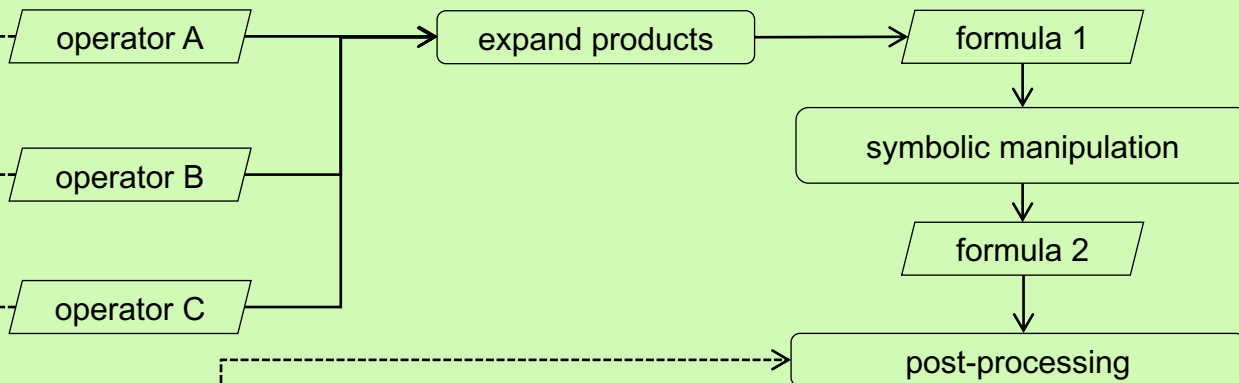
```
# CC E and Residual -----
new_target('CCD_E_R')
depend('CCD_LAG')

DERIVATIVE({LABEL_RES: 'CCD_R', LABEL_IN: 'CCD_LAG',
            OP_RES: 'O2', OP_DERIV: 'L2'})
INVARIANT({LABEL_RES: 'CCD_E', LABEL_IN: 'CCD_LAG',
            OP_RES: 'ECCD', OPERATORS: ['L2']})
```

$$(\Omega_2)_{ab}^{ij} = \frac{\partial \mathcal{L}}{\partial \lambda_{ab}^{ij}}$$

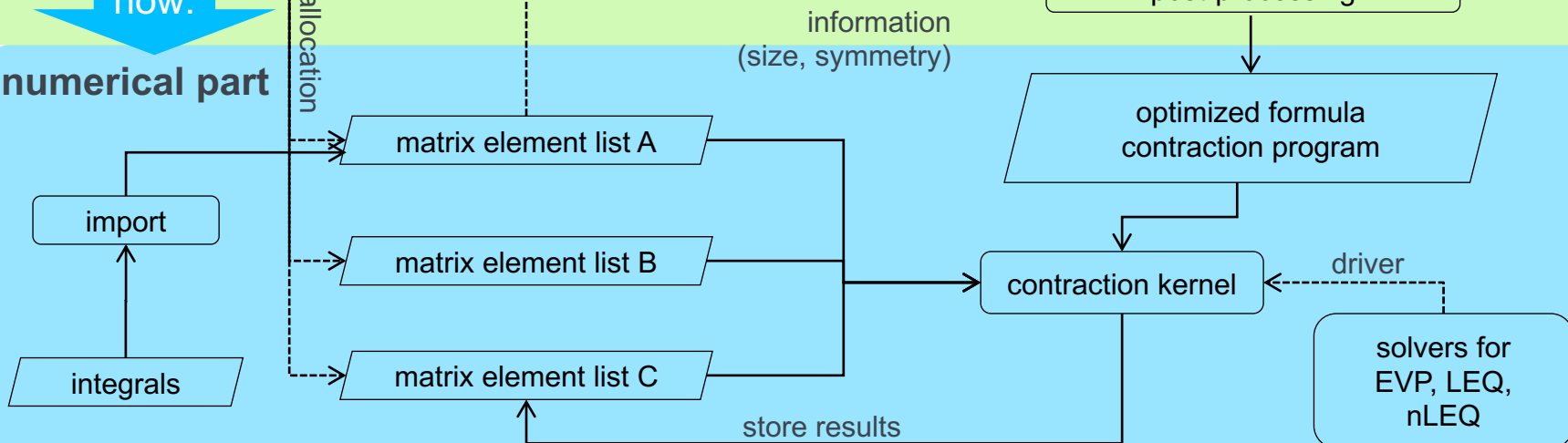
Organization of GeCCo – basic idea

symbolic algebra



now:

numerical part



Towards numerical evaluation: Optimizations

Strength reduction → binary contractions

$$\sum_{cdkl} g_{kl}^{cd} t_{ab}^{ik} t_{cd}^{jl} = \sum_k \left(\sum_{cdl} g_{kl}^{cd} t_{cd}^{jl} \right) t_{ab}^{ik}$$

Common subexpression identification (recursive intermediate fact.)

$$\sum_k f_j^k t_{ab}^{ik} + \sum_k \left(\sum_{cdl} g_{kl}^{cd} t_{cd}^{jl} \right) t_{ab}^{ik} = \sum_k \left(f_j^k + \sum_{cdl} g_{kl}^{cd} t_{cd}^{jl} \right) t_{ab}^{ik}$$

not coupled here

Alternative: Pre-define intermediates (not automated)

 Optimized list of binary contractions



Towards numerical evaluation: Tensor contraction kernel

$$R_{ab}^{ij} \leftarrow \sum_{kl} g_{kl}^{jd} t_{abd}^{ikl}$$

external indices

contraction indices

General scheme:

$$A(\mathcal{K}) \rightarrow A(\mathcal{C}, \mathcal{K}_0)$$

$$B(\mathcal{L}) \rightarrow B(\mathcal{C}^\dagger, \mathcal{L}_0)$$

$$R(\mathcal{K}_0, \mathcal{L}_0) = A(\mathcal{C}, \mathcal{K}_0)B(\mathcal{C}^\dagger, \mathcal{L}_0)$$

$$R(\mathcal{K}_0, \mathcal{L}_0) \rightarrow R(\mathcal{I})$$

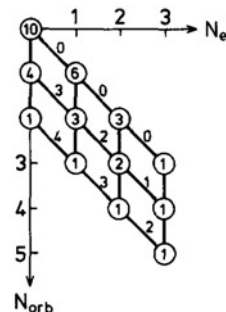
Address string is composed of substrings:

$$\mathcal{K} = \mathcal{K}_H^c \mathcal{K}_P^c \mathcal{K}_V^c \mathcal{K}_H^a \mathcal{K}_P^a \mathcal{K}_V^a$$

Generate unique flat index for substrings:

String resolutions come with sign changes and increased sparsity (unpacking):

$$(ij) \rightarrow \begin{matrix} 0 & + & + & + \\ - & 0 & + & + \\ - & - & 0 & + \\ - & - & - & 0 \end{matrix}$$



Batched unpacking, use sparsity in outer loops, innermost loops use dgemm

Olsen, Roos, Jørgensen, Jensen, JCP **89**, 2185 (1988)

Kállay, Surján, JCP **115**, 2945 (2001)



Application examples

F12 theory

$$\exp(\hat{T}_1 + \hat{T}_2 + \hat{T}_2')|\Phi_0\rangle$$

$$\hat{T}_2' = \sum_{i>j, k>l, \alpha>\beta} c_{kl}^{ij} \langle \alpha\beta | \hat{Q}_{12} f(r_{12}) | kl \rangle \hat{a}_{kl}^{\alpha\beta}$$

Complete basis correction

Comment on Quintuple- ζ quality coupled-cluster correlation energies with triple- ζ basis sets by D. P. Tew, W. Klopper, C. Neiss and C. Hättig, *Phys. Chem. Chem. Phys.*, 2007, 9, 1921 [erratum]

David P. Tew,^a Wim Klopper,^{*a} Christian Neiss^b and Christof Hättig^c

Received 7th July 2008, Accepted 18th July 2008

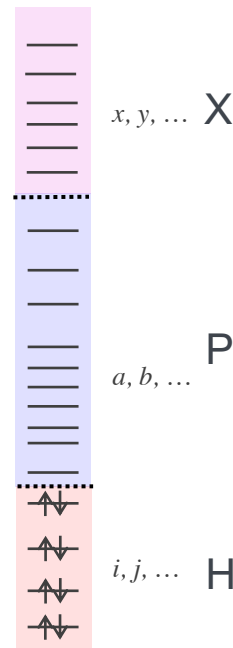
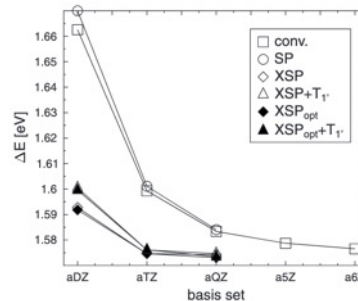
First published as an Advance Article on the web 15th September 2008

DOI: 10.1039/b811567b

erroneous values. Our current implementation is in complete agreement with an independently programmed CCSD(F12) program that uses generalised contraction routines² and we are certain that the values reported here are reliable. The

2 A. Köhn and G. Richings, private communication.

$$\exp(\hat{T}_1 + \hat{T}_2 + \hat{R} + [\hat{R}, \hat{T}_1 + \hat{T}_2])|\Phi_0\rangle$$



“Full” CCSD-F12

AK, Richings, Tew, JCP 129, 201103 (2008)

Shiozaki, Kamiya, Hirata, Valeev, JCP 129, 071101 (2008)

AK, Tew, JCP 133, 174117 (2010)

Explicitly-correlated triple excitations

AK, JCP 130, 131101 (2009)

AK, JCP 133, 174118 (2010)

CCSD-F12 response theory

AK, JCP 130, 104104 (2009)

Hanauer, AK, JCP 131, 124118 (2009)



Application examples

Multireference coupled-cluster theory

$$|\Psi\rangle = e^{\hat{T}}|\psi_0\rangle = e^{\hat{T}}\sum_{\mu}|\Phi_{\mu}\rangle c_{\mu}$$

$$|\Psi_0\rangle = \sum_{tuvw} C_{tuvw}^{(0)}\{\hat{a}^t\hat{a}^u\hat{a}^v\hat{a}^w\}|0\rangle$$

Evangelista, Gauss, JCP 134, 114102 (2011)

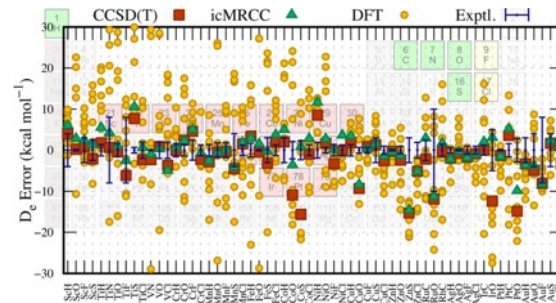
Hanauer, Köhn, JCP 134, 204111 (2011)

Interesting features:

Spin-adapted, strong analogy to single-reference theory, orbital invariance

But: Very complex eq.s

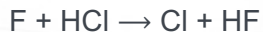
Benchmarking transition metal bond energies



Aoto, Lima Batista, AK, Oliveira-Filho, JCTC 13, 5291 (2017)

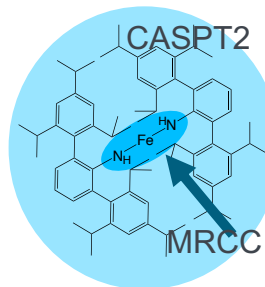
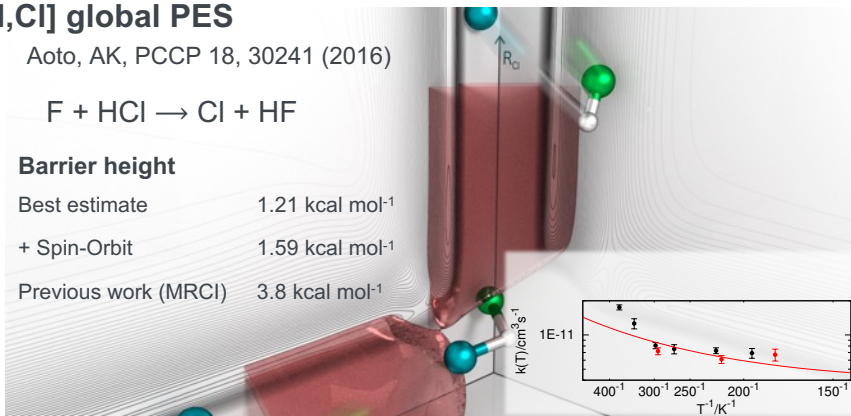
[F,H,Cl] global PES

Aoto, AK, PCCP 18, 30241 (2016)

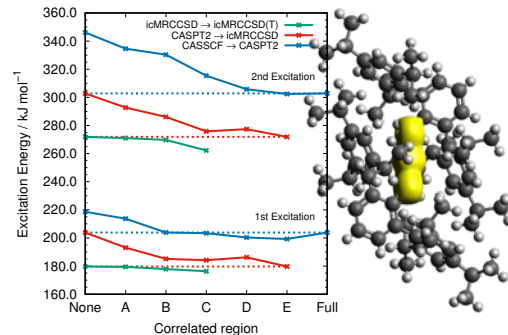


Barrier height

Best estimate	1.21 kcal mol ⁻¹
+ Spin-Orbit	1.59 kcal mol ⁻¹
Previous work (MRCI)	3.8 kcal mol ⁻¹



Larger systems by embedding



Coughtrie, Giereth, Kats, Werner, AK, JCTC 14, 693 (2018)



Improving numerical evaluation: Translation

GeCCo's numerics are not bad, but certainly not good enough for routine applications

Couple to a more efficient tensor evaluation framework: ITF (Knizia, Shamasundar, Kats)

Encode algorithm in meta-language

```
tensor: R[aaai], !Create{type:disk; sym:01/23}, ResT2  
.  
.  
.
```

Uses intrinsic features of Molpro

```
for [k,j]:  
  .R[abkj] += K[abkj]  
  
  load K4E[abkj]  
  .R[abkj] += K4E[abkj]  
  drop K4E[abkj]  
  
  alloc C[abkj]  
  .C[abkj] += T[abkj]  
  .C[abkj] += t[ak] t[bj]  
  .R[abmn] += C[abkj] A[mnkj]  
  drop C[abkj]
```

Hand-written code
Some optimization by Ch.
Köppl, PhD-thesis

integral-direct two-electron transformations

$$\frac{1}{2} \sum_{cd} g_{ab}^{cd} (t_{cd}^{ij} + t_c^i t_d^j)$$

coupling coefficients and densities for internally contracted theories

Shamasundar, Knizia, Werner, JCP **135**, 054101 (2011)

Kats, Manby, JCP **138**, 144101 (2013)



Improving numerical evaluation: Translation

Use pre-optimized sequence of binary contractions from GeCCO,
translate to ITF code

Josh A. Black

Main issues: GeCCo is spin-orbital string based

Must work out spin summation and explicit labels + signs

Post-processing to meet ITF syntax (declarations etc.)

Write new C++ driver code

Current status: Only CAS(2,2), only partial spin
summation and no optimal factorization of non-linear
terms

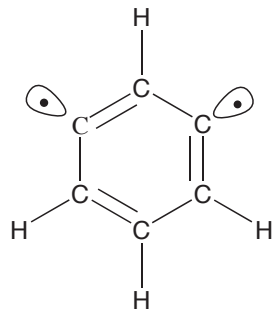
$$\sum_{vw} \gamma_w^v \sum_{abi} g_{iv}^{ab} t_{ab}^{iw}$$



$$\sum_{vw} \Gamma_w^v \sum_{abi} K_{iv}^{ab} (2T_{ab}^{iw} - T_{ba}^{iw})$$



Performance



singlet state
CAS(2,2)

Approximation with
linearization of “difficult
terms” (many active space
indices)

Parallelization: Too granular code
currently, embarrassingly parallel
tasks (Gradients, Hessian) work well

integral trafo + resort

Method (Impl.)	Basis set	Overhead [s]	Time/iter [s]	# iter
icMRCCSD (GeCCo)	cc-pVDZ	56	42	20
	cc-pVTZ	1282	441	21
icMRCCSD (ITF)	cc-pVDZ	0.7	10	21
	cc-pVTZ	3	68	20
	cc-pV5Z	238	3872	20
icMRCC/CEPA (ITF)	cc-pVTZ	3	5	31
	cc-pV5Z	237	251	31
CCSD (Molpro)	c-pVTZ	1	1.7	16
	cc-pV5Z	190	142	16

#bf: 104 (cc-pVDZ), 236 (cc-pVTZ), 766 (cc-pV5Z)

Black, Waigum, Adam, Shamasundar, AK, JCP **158**, 134801 (2023)



Future aims

GeCCo → Lizard github.com/KoehnLab/Lizard

Goals: Term generation features of GeCCo + code generation
for tensor engines

Robert Adam

More modularity (or: less monolithic)
(interfaces to other term generators,
other tensor contraction kernels)

Python interface for input control and fast prototyping

Improvements, like:

- Generalization of index spaces (e.g. for tensor decompositions)

- More global representation of terms (expression trees)

- New treatment of index permutations



Future aims

In fact there are many related projects (Quantum Chemistry focus, as collected by Robert):

- Early work by Janssen & Schaefer [1]
- TCE (Hirata et al. [2])
- SMITH (Shiozaki et al. [3])
- ACE (Song et al. [4])
- MRCC (Kállay et al. [5])
- Orca-AGE (Krupika et al. [6])
- GeCCo (Köhn et al. [7])
- SeQuant (by Valeev group)
- drudge (Zhao [8])
- Cadabra (Peeters [9]; v2: Peeters [10])
- Datta & Gauss [11]
- MacLeod & Shiozaki [12]
- ITF (Molpro [13])
- squant (Kats)
- SIAL (ACES III [14])
- CTF (Solomonik et al. [15])
- libtensor (Epifanovsky et al. [16])
- tiledarray (Peng et al. [17])



Future aims

Brainstorming: How could we all better interact?

Some standard(s) to store generated equations?

Some API standard(s) for tensor contraction engines?

Review paper on best practices?



Some references for slide 24

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